



PROJECT PLANNING AND SCHEDULING



Planning and scheduling

- ❑ Levels of planning and scheduling
 - Long-range planning (several years),
 - middle-range planning (1-2 years),
 - short-range planning (few months),
 - **scheduling** (few weeks), and
 - reactive scheduling (now)
- ❑ These functions are now often integrated

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Project planning

- ❑ Planning and scheduling of *jobs (activities)* subjected to precedence constraints.
- ❑ Setting is a parallel machine environment with unlimited number of machines.
- ❑ **Objective:** minimize makespan

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Project properties

- ❑ Project goals: quality, time, costs, customer satisfaction
- ❑ Network of activities/jobs
- ❑ Limited resource capacity
- ❑ Project life-cycle:
 - Order acceptance
 - Engineering and process planning
 - Material and resource scheduling
 - Project execution
 - Evaluation and service

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Project areas

- ❑ Construction
- ❑ Production
- ❑ Management
- ❑ Research
- ❑ Maintenance
- ❑ Installation, implementation
- ❖ **Examples:** construction of power generation centers, software developments, launching of aircrafts, design, development and construction of defense vehicles.

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Project representation

- ❑ Example: planning a concert

Job	Description	Predecessors
A	Plan concert	-
B	Advertise	A
C	Sell tickets	A
D	Hold concert	B, C

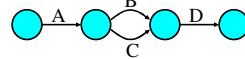
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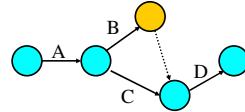


Job-on-arc format

- Not allowed: two jobs cannot have the same starting and ending node!



- Need to introduce a dummy job:



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Example 1

- Setting up a production facility

Job	Description	Duration (p_j)
1	Design production tooling	4 weeks
2	Prepare manufacturing drawings	6 weeks
3	Prepare production facility for new tools and parts	10 weeks
4	Procure tooling	12 weeks
5	Procure production parts	10 weeks
6	Kit parts	2 weeks
7	Install tools	4 weeks
8	Testing	2 weeks

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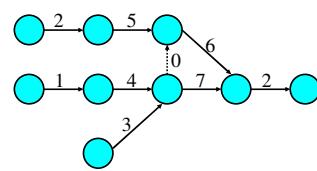
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Precedence graph

Job	Immediate predecessors	Immediate successors
1	-	4
2	-	5
3	-	6, 7
4	1	6, 7
5	2	6
6	3, 4, 5	8
7	3, 4	8
8	6, 7	-

Job-on-arc network



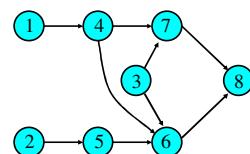
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Job-on-node format

- No need for a dummy node
- Nodes can be depicted as rectangles



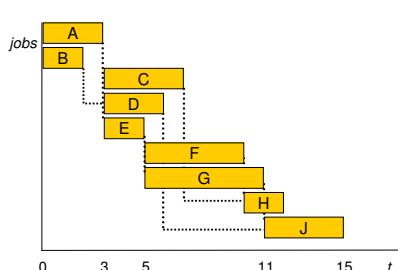
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Jobs on a time axis

j	precedence
A:	-
B:	-
C:	A
D:	A, B
E:	A
F:	E
G:	E
H:	C, F
J:	D, G



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Critical Path Method (CPM)

- Processing time, p_j , of job j is fixed. A job does not require any resource.
- Unlimited number of machines in parallel and n jobs with precedence constraints.
- Objective:** minimize makespan
- **slack job:** the start of its processing time can be postponed without increasing the makespan
- **critical job:** the job that cannot be postponed
- **critical path:** the set of critical jobs

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Critical Path Method

Forward procedure

- Starting at time zero, calculate the **earliest** each job can be started
- The completion time of the last job is the makespan

Backward procedure

- Starting at time equal to the makespan, calculate the **latest** each job can be started so that the makespan obtained in the forward procedure is realized.
- Finds the **critical path**.

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Critical Path Method

Notation:

- p_j processing time of job j
- S'_j earliest possible starting time of job j
- C'_j earliest possible completion time of job j
- S''_j latest possible starting time of job j
- C''_j latest possible completion time of job j
- $C'_j = S'_j + p_j$
- $\{ \text{all } k \rightarrow j \}$ jobs that are predecessors of job j
- $\{ j \rightarrow \text{all } k \}$ jobs that are successors of job j

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Forward procedure

Step 1:

Set time $t = 0$
Set $S_j = 0$ and set $C'_j = p_j$, for all jobs j with no predecessors

Step 2:

Compute for each job j

$$S'_j = \max_{\{ \text{all } k \rightarrow j \}} C'_k,$$

$$C'_j = S'_j + p_j$$

Step 3:

The optimal makespan is $C_{\max} = \max(C'_1, C'_2, \dots, C'_n)$

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Backward procedure

Step 1:

Set $t = C_{\max}$
Set $C''_j = C_{\max}$ and $S''_j = C_{\max} - p_j$ for jobs j with no successors

Step 2:

Compute for each job j

$$C''_j = \min_{\{ j \rightarrow \text{all } k \}} S''_k,$$

$$S''_j = C''_j - p_j$$

Step 3:

Verify that $\min(S''_1, \dots, S''_n) = 0$

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Comments

- The forward procedure gives the earliest possible starting time for each job
- The backwards procedures gives the latest possible starting time for each job
- If these are equal the job is a **critical job**.
- If these are different the job is a **slack job**, and the difference is the **float**.
- A **critical path** is a chain of jobs starting at time 0 and ending at C_{\max} .

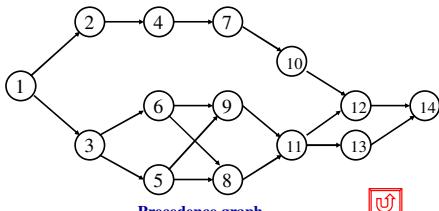
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Example 2

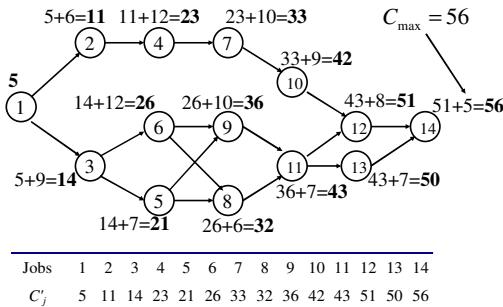
Jobs	1	2	3	4	5	6	7	8	9	10	11	12	13	14
p_j	5	6	9	12	7	12	10	6	10	9	7	8	7	5



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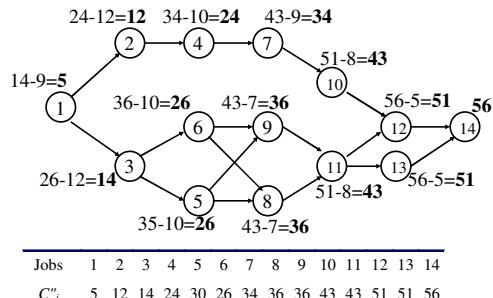
Example 2: forward procedure



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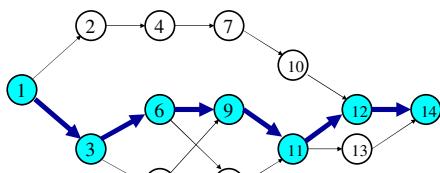
Example 2: backward procedure



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Example 2: Critical Path



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Program Evaluation and Review Technique

- ❑ Processing times is not deterministic in PERT.
- ❑ Processing time of job j is random with mean μ_j and variance σ_j^2 .
- ❑ Want to determine the **expected makespan**
- ❑ Assuming:
 - p_j^a = optimistic processing time of job j
 - p_j^m = most likely processing time (mode) of job j
 - p_j^b = pessimistic processing time of job j

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Expected Makespan

- ❑ Estimation of **expected processing time**:

$$\hat{\mu}_j = \frac{p_j^a + 4p_j^m + p_j^b}{6}$$

- ❑ Apply CPM with expected processing times.

- ❑ Let J_{cp} be a critical path.

- ❑ Estimation of **expected makespan**:

$$\hat{E}(C_{\max}) = \sum_{j \in J_{cp}} \hat{\mu}_j$$

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Distribution of makespan

- ❑ Estimation of the variance of processing times:

$$\hat{\sigma}_j^2 = \left(\frac{p_j^b - p_j^a}{6} \right)^2$$

- ❑ Estimation of the variance of the makespan

$$\hat{V}(C_{\max}) = \sum_{j \in J_{cp}} \hat{\sigma}_j^2$$

- ❑ Assume it is **normally distributed** (Gaussian)

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Example 2 using PERT (1)

Jobs	1	2	3	4	5	6	7	8	9	10	11	12	13	14
p_j^a	4	4	8	10	6	12	4	5	10	7	6	6	7	2
p_j^m	5	6	8	11	7	12	11	6	10	8	7	8	7	5
p_j^b	6	8	14	18	8	12	12	7	10	15	8	10	7	8

- ❑ Precedence constraints as before.

- ❑ Estimation of means and standard deviations:

Jobs	1	2	3	4	5	6	7	8	9	10	11	12	13	14
μ_j	5	6	9	12	7	12	10	6	10	9	7	8	7	5
σ_j	0.33	0.67	1	1.33	0.33	0	1.33	0.33	0	1.33	0.33	0.66	0	1
σ_j^2	0.11	0.44	1	1.78	0.11	0	1.78	0.11	0	1.78	0.11	0.44	0	1

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Example 2 using PERT (2)

- ❑ Critical path is the same:

$$1 \rightarrow 3 \rightarrow 6 \rightarrow 9 \rightarrow 11 \rightarrow 12 \rightarrow 14$$

- ❑ Estimated makespan:

$$\hat{E}(C_{\max}) = \sum_{j \in J_{cp}} \hat{\mu}_j = 56$$

- ❑ Estimate of the variance of the makespan:

$$\hat{V}(C_{\max}) = \sum_{j \in J_{cp}} \sigma_j^2 = 2.66$$

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Example 2 using PERT (3)

- ❑ Probability that the project is completed by time 60 is:

$$\Phi\left(\frac{60-56}{\sqrt{2.66}}\right) = \Phi(2.449) = 0.993$$

- where $\Phi(x)$ is the probability that a normally distributed random variable ($\mu=0$, $\sigma=1$) is less than x .

- ❑ For the path: $1 \rightarrow 2 \rightarrow 4 \rightarrow 7 \rightarrow 10 \rightarrow 12 \rightarrow 14$ the estimated makespan is 55. The variance is 7.33

- ❑ Probability that the project is completed by time 60 is:

$$\Phi\left(\frac{60-55}{\sqrt{7.33}}\right) = \Phi(1.846) = 0.968$$

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Potential problems with PERT

- ❑ Always underestimates project duration
 - other paths may delay the project

- ❑ Non-critical paths ignored
 - critical path probability
 - critical activity probability

- ❑ Activities are not always independent
 - same raw material, weather conditions, etc.

- ❑ Estimates may be inaccurate

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Time/Cost tradeoffs: linear costs

- ❑ By **allocating money** (for additional resources) to jobs their processing time p_j can be reduced

- ❑ Assume that processing times are fixed

- ❑ Linear relation between allocated money and p_j

- ❑ Processing time:

$$p_j^{\min} \leq p_j \leq p_j^{\max}$$

- ❑ Marginal cost of reducing processing time by one time unit:

$$c_j = \frac{c_j^a - c_j^b}{p_j^{\max} - p_j^{\min}}$$

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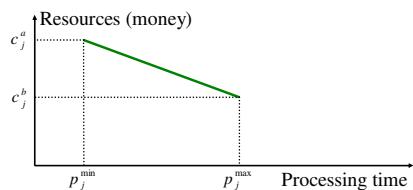
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Linear cost

- ❑ Cost of processing job j in p_j time units ($p_j^{\min} \leq p_j \leq p_j^{\max}$):

$$c_j^b + c_j(p_j^{\max} - p_j)$$



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Solution methods

❑ **Objective:** minimum cost of project

❑ **Time/Cost Trade-Off Heuristic**

- Good schedules (not optimal)
- Works also for nonlinear costs

❑ **Linear programming formulation**

- *Always* optimal schedules
- Nonlinear version not easily solved

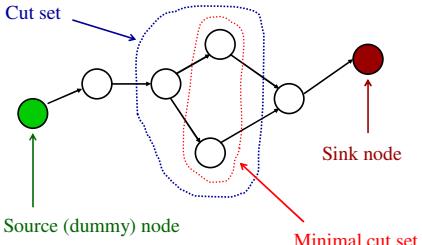
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Sources, Sinks, and Cut sets

G_{cp} – subgraph consisting of critical paths



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Time/Cost Trade-Off Heuristic

Step 1:

- Set all processing times at their maximum: $p_j = p_j^{\max}$
- Determine all critical paths with these processing times
- Construct the graph G_{cp} of critical paths

Step 2:

- Determine all minimum cut sets in the current G_{cp}
- Consider only those cut sets where all processing times are larger than their minimum: $p_j > p_j^{\min}, \forall j \in G_{cp}$
- If there is no such set STOP

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Time/Cost Trade-Off Heuristic

Step 3:

- For each minimum cut set compute the cost of reducing all its processing times by one time unit.
- Take the minimum cut set with the lowest cost.
- If this is greater or equal than the overhead cost c_o per unit time STOP

Step 4:

- Reduce all processing times in the minimum cut set by one time unit
- Determine the new set of critical paths
- Revise graph G_{cp} accordingly and go back to Step 2

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Example 3 (example 2 modified)

j	1	2	3	4	5	6	7	8	9	10	11	12	13	14
p_j^{\max}	5	6	9	12	7	12	10	6	10	9	7	8	7	5
p_j^{\min}	3	5	7	9	5	9	8	3	7	5	6	5	5	2
c_j^a	20	25	20	15	30	40	35	25	30	20	25	35	20	10
c_j	7	2	4	3	4	3	4	4	4	5	2	2	4	8

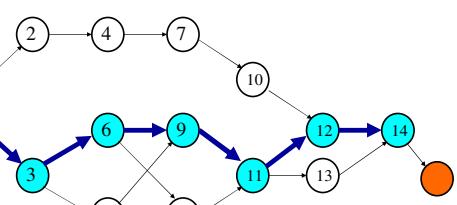
Overhead: $c_o = 6$ (cost of project per time unit)

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1. Max. processing times, find G_{cp}

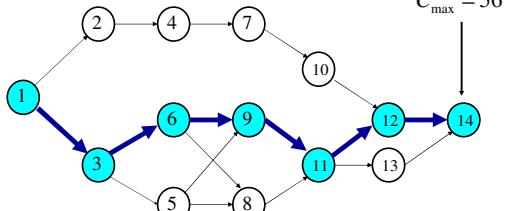


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1. Max. processing times, find G_{cp}

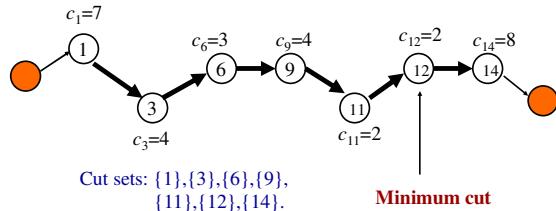
Cost = overhead + job costs = $c_o * C_{\max} + \sum c_j^a$
 $= 6 * 56 + 350 = 686$



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2, 3. Min. cut sets in G_{cp} & lowest cost



Cut sets: {1},{3},{6},{9},
{11},{12},{14}.

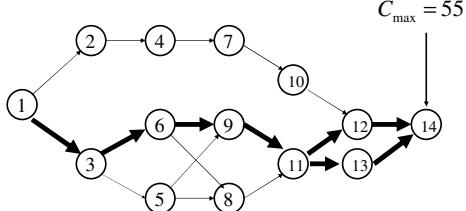
Minimum cut set with lowest cost

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4. Reduce proc. time for each job by 1

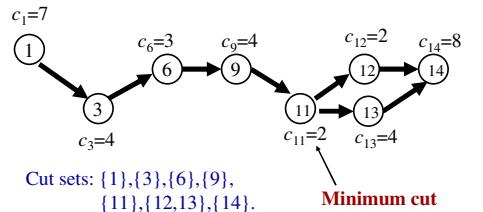
Cost = overhead + job costs = $c_o * C_{\max} + \sum c_j^a$
 $= 6 * 55 + 352 = 682$



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2, 3. Min. cut sets in G_{cp} & lowest cost



Cut sets: {1},{3},{6},{9},
{11},{12},{14}.

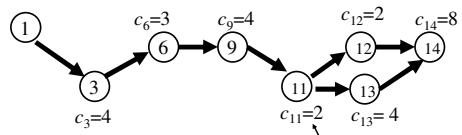
Minimum cut set with lowest cost

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Next 3 iterations

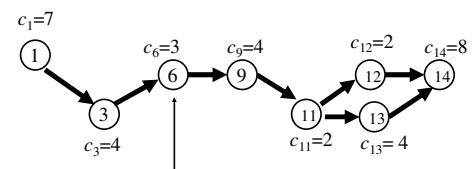
Cost = overhead + job costs = $c_o * C_{\max} + \sum c_j^a$
 $= 6 * 52 + 355 = 667$



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Step 1, 2, and 3

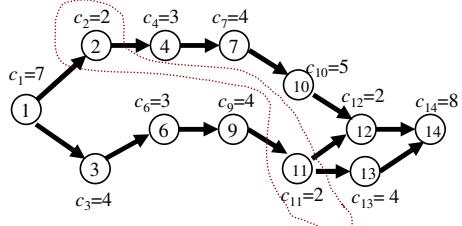


Reduce processing time
next on job 6

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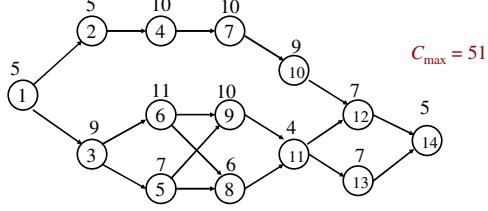
After more iterations ...



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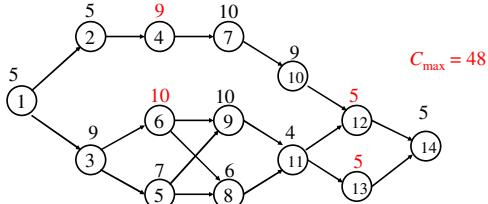
Obtained solution



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Other optimal solution



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Linear programming formulation

- ❑ The heuristic does not guarantee optimum
 - See example 4.4.3 from Pinedo's book
- ❑ Here total cost is linear so use LP

$$c_o C_{\max} + \sum_{j=1}^n (c_j^b + c_j(p_j^{\max} - p_j))$$

- ❑ Ignoring the constant terms:

$$c_o C_{\max} - \sum_{j=1}^n c_j p_j.$$

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Linear Program

- ❑ The processing time p_j of a job j is a **decision variable**.
- ❑ The earliest possible starting time of a job j is denoted as x_j , and is also a decision variable.
- ❑ For jobs k without predecessors $x_k = 0$, and $p_j^{\min} \leq p_j \leq p_j^{\max}$
- ❑ The linear problem has $2n + 1$ decision variables: $C_{\max}, p_1, \dots, p_n, x_1, \dots, x_n$.

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Linear Program

$$\begin{aligned} \text{minimize} \quad & c_o C_{\max} - \sum_{j=1}^n c_j p_j. \\ \text{subject to} \quad & x_k - p_j - x_j \geq 0, \forall j \rightarrow k \in A \\ & p_j \leq p_j^{\max}, \forall j \\ & p_j \geq p_j^{\min}, \forall j \\ & x_j \geq 0, \forall j \\ & C_{\max} - x_j - p_j \geq 0, \forall j \end{aligned}$$

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Nonlinear costs

Discrete time-framework:

- ❑ Arbitrary function $c_j(p_j) \rightarrow$ cost of setting job j to processing time p_j
- ❑ decreasing convex cost-function

$$c_j(p_j-1) - c_j(p_j) \geq c_j(p_j) - c_j(p_j+1)$$
- ❑ non-decreasing overhead cost-function $c_o(t)$
- ❑ Given processing times and $c_j(p_j)$, which algorithm can be used (heuristic or LP)?

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Nonlinear costs

Continuous time-framework:

- ❑ **Nonlinear programming** problem with the same constraints as the LP model.
- ❑ Objective function:

$$\int_0^{C_{\max}} c_o(t) dt + \sum_j c_j(p_j)$$

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Workforce (Resource) constraints

- ❑ **Project Scheduling with Workforce Constraints** = Resource Constrained Project Scheduling (RCPS)

Notation

- ❑ n jobs $j = 1, \dots, n$
- ❑ N different pools in workforce $i = 1, \dots, N$
- ❑ W_i total number of operators in pool i
- ❑ W_{ij} number of operators in pool i needed for job j
- ❑ **Objective:** minimize makespan

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Example 4

- ❑ Five jobs and two types of operators:

- 4 operators of type 1
- 8 operators of type 2

Jobs	1	2	3	4	5	Job	Immediate Predecessors	Immediate Successors
p_j	8	4	6	4	4	1	—	4
W_{1j}	2	1	3	1	2	2	—	5
W_{2j}	3	0	4	0	3	3	—	5
						4	1	—
						5	2, 3	—

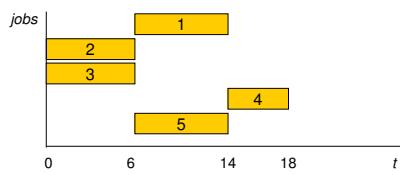
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Solution of example 4

- ❑ Without workforce constraints, critical path is $1 \rightarrow 4$, with $C_{\max} = 12$.
- ❑ Optimal schedule: $C_{\max} = 18$.
- ❑ **Optimal schedule:**



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Workforce Constraints

- ❑ This is a **very hard** problem. Cannot be solved using linear programming.
- ❑ Can be formulated as an **integer programming** problem.
- ❑ Let job $n + 1$ be a dummy job (sink)
- ❑ Let x_{jt} be a binary variable:

$$x_{jt} = \begin{cases} 1 & \text{if job } j \text{ is completed exactly at time } t \\ 0 & \text{otherwise.} \end{cases}$$

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Makespan

- Let H be an upper bound of makespan, as e.g.:

$$H = \sum_{j=1}^n p_j$$

- Completion time of job j is

$$\sum_{t=1}^H t x_{jt}$$

- Makespan:

$$\sum_{t=1}^H t x_{n+1,t}$$

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Integer Programming formulation

$$\text{minimize } \sum_{t=1}^H t x_{n+1,t}$$

$$\text{subject to } \sum_{t=1}^H t x_{jt} + p_k - \sum_{t=1}^H t x_{kt} \leq 0 \quad \text{precedence constraints}$$

$$\sum_{j=1}^n \left(W_{ij} \sum_{u=t}^{t+p_j-1} x_{ju} \right) \leq W_j \quad \text{total demand of pool } i$$

$$\sum_{t=1}^H x_{jt} = 1 \quad \text{jobs are processed}$$

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In practice

- The IP problem is very hard to be solved when number of jobs is large and time horizon is long.
- (Almost) always resource constraints
- Heuristics**
resource constraint → precedence constraint
- Job shop scheduling is a special case of this problem

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Rome laboratory Outage MANager



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- Shut down of a nuclear power plant for maintenance
- Should be done very carefully!**
- 10 000 to 40 000 jobs
- 1 000 000 euros per day

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ROMAN problem

- Given a set of jobs, precedence constraints and resource requirements, assign resources to jobs for specific periods to:
 - Minimize makespan
 - Ensure that all jobs can be done safely
- Jobs:** refueling, repairs, plant modifications, maintenance

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Approach

- Decision tree for sophisticated safety analysis
- Constraint programming* based project scheduling system
 - Builds on basic algorithms to be studied
- See papers!

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